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# Streitz-Mintmire Potential, Variable Charge Equilibration, and Chemical Species Analysis for ReaxFF

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Sandia National Laboratories, New Mexico

3<sup>rd</sup> LAMMPS Users' Workshop and Symposium  
Albuquerque, NM August 6-8, 2013

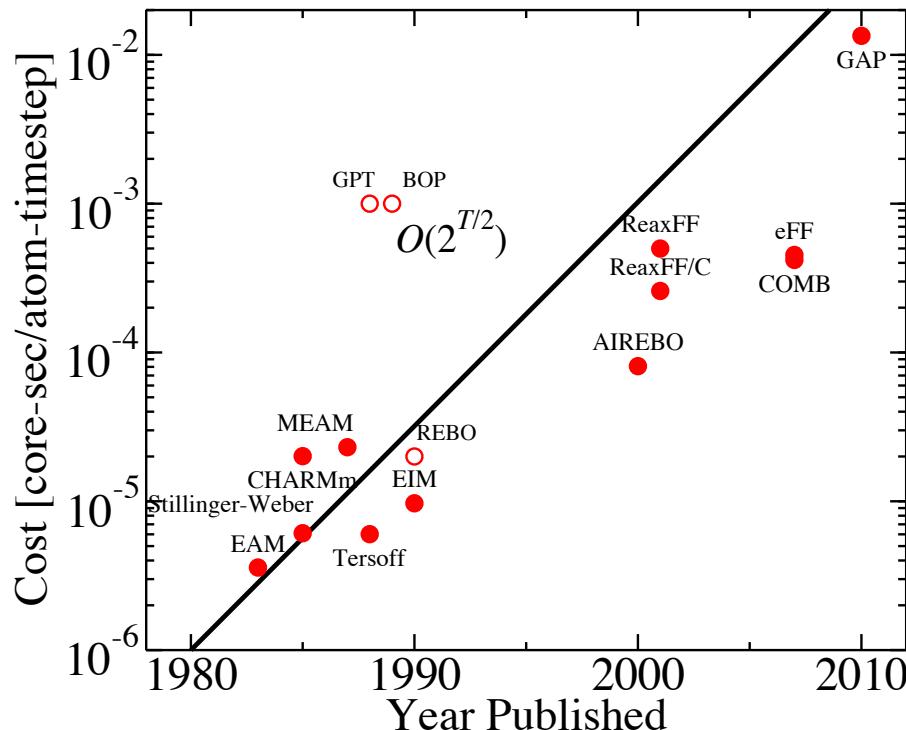


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# Explosive Growth in Complexity of Interatomic Potentials

- Driver: Availability of Accurate QM data

- Exposes limitations of existing potentials
- Provides more data for fitting



Aidan Thompson's talk,  
Session II, 10:35, Thursday

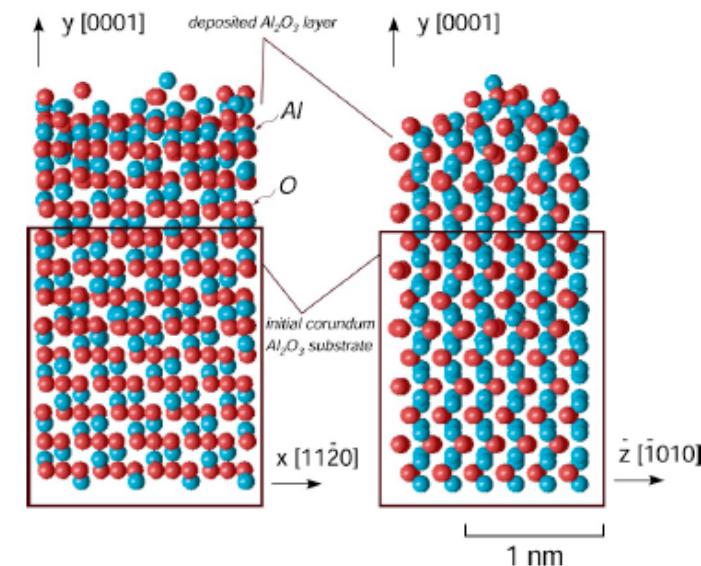
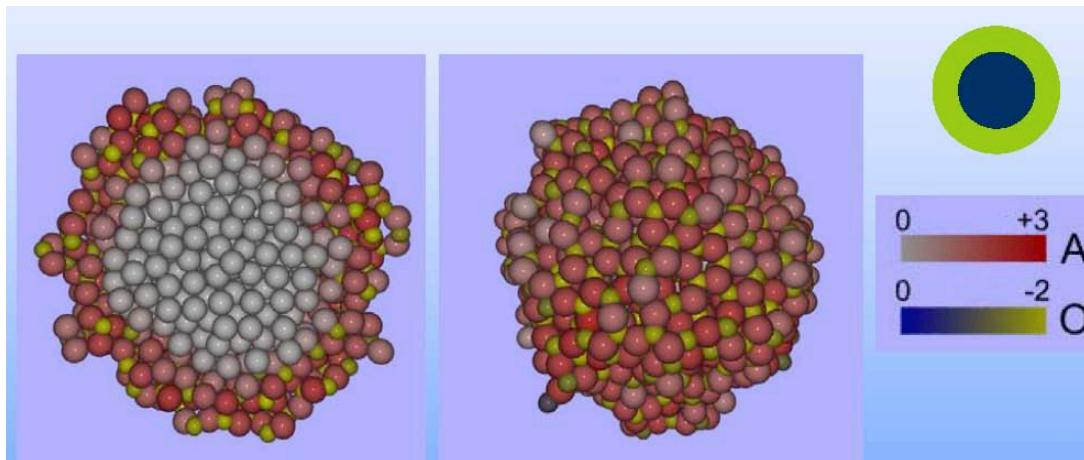
Moore's Law for Interatomic Potentials  
Plimpton and Thompson, MRS Bulletin (2012).

# STREITZ-MINTMIRE POTENTIAL

# Streitz-Mintmire Potential

F. H. Streitz and J. W. Mintmire, Phys. Rev. B 50, 11996 (1994)

- Developed in 1994 for Al/Al<sub>2</sub>O<sub>3</sub>
- First variable charge potentials
  - Along with *fluc-q* force field by Rick, Stewart and Berne<sup>1</sup>
- Application to Al/Al<sub>2</sub>O<sub>3</sub> core-shell nanoparticle<sup>2</sup> and vapor deposition of Al<sub>2</sub>O<sub>3</sub><sup>3</sup>



<sup>1</sup> S. W. Rick, S. J. Stuart, and B. J. Berne, *J. Chem. Phys.* 101 6141 (1994)

<sup>2</sup> T. Hawa and M. R. Zachaeriah, *Phys Rev. B.*, 2005

<sup>3</sup> X. W. Zhou, H. N. G. Wadley, J.-S. Fillhol, and M. N. Neurock, *Phys. Rev. B* 69, 035402 (2004)

# Streitz-Mintmire Potential

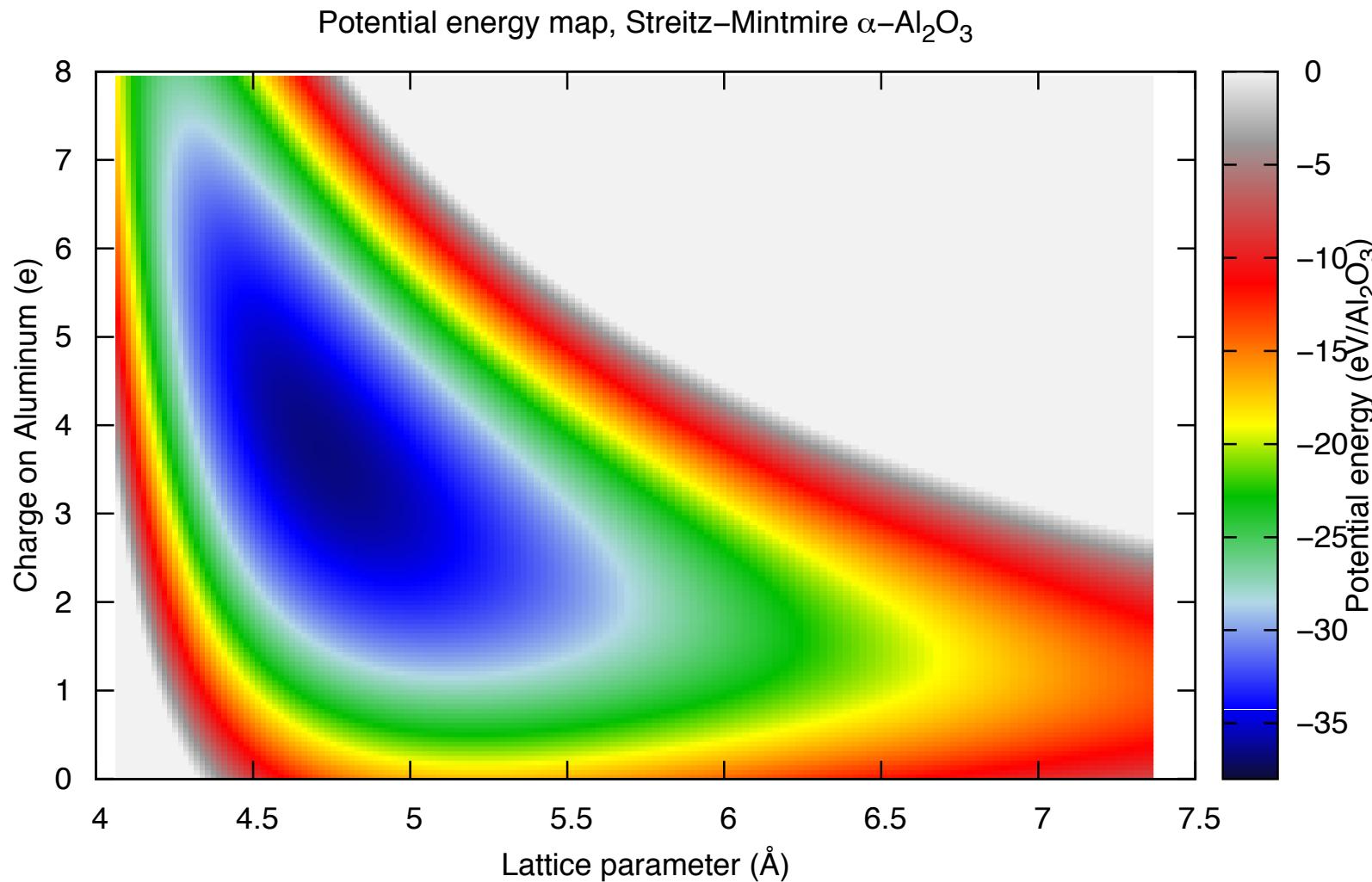
- Long range electrostatics potential (**with Ewald Sum**)
- Variable charge (**via electronegativity equalization method**)
- Couples to short-range potential (**with embedded atom method**)
- Electrostatics potential formalism:

- $$E_{es} = \sum_i E_i(q) + \frac{1}{2} \sum_{i \neq j} V_{ij}(r_{ij}, q_i, q_j)$$
- $$E_i(q_i) = E_i(0) + \chi_i q_i + \frac{1}{2} \eta_i q_i^2$$
- $$V_{ij}(r_{ij}, q_i, q_j) = \int d^3 r_i \int d^3 r_j \cdot \rho_i(r_i, q_i) \cdot \rho_j(r_j, q_j) / r_{ij}$$
  - $\rho_i(r_i, q_i) = Z_i \delta(r - r_i) + (q_i - Z_i) f_i(r - r_i)$

# Implementation in LAMMPS

- Long range electrostatics potential
  - Implemented with Ewald Sum or Wolf Sum
- Variable charge
  - EEM method; Implemented as fix qeq/sm
- Couples to short-range potential
  - Via pair\_style hybrid/overlay
  - Default to EAM
  - Once supplied with self energy parameters, can be coupled to any short-range, charge independent pair styles, e.g. Tersoff, SW
    - $E_i(q_i) = E_i(0) + \chi_i q_i + \frac{1}{2} \eta_i q_i^2$

# Potential energy map, $\alpha\text{-Al}_2\text{O}_3$



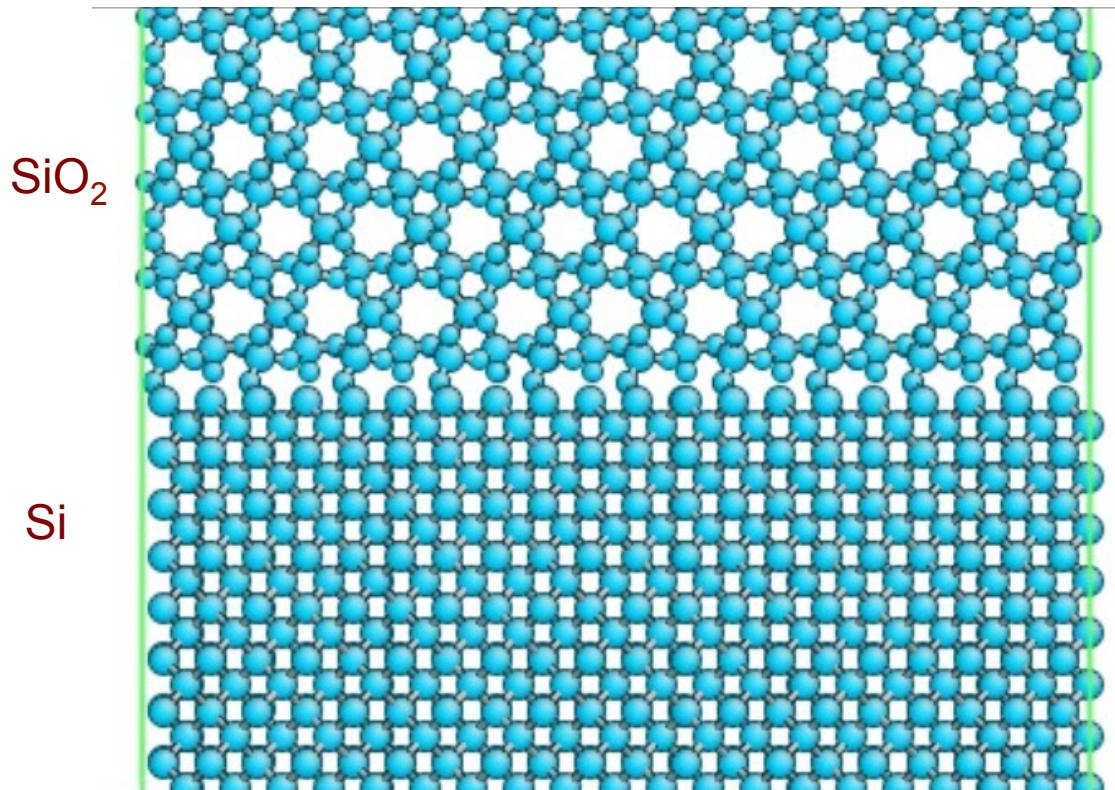
# Summary and Outlooks

- Original Streitz-Mintmire Potential for Al/Al<sub>2</sub>O<sub>3</sub> will be released soon
  - Long range, electrostatic, variable charge potential
  - Does not yet include modifications by Zhou et al (PRB 2004)
- Implementation allows coupling with all pair styles via hybrid/overlay
  - Can be applied to a wide range of pair styles
  - Supply self energy parameters
  - Done with Tersoff for SiO<sub>2</sub>

# VARIABLE CHARGE EQUILIBRATION

# Charge equilibration

- Si/ $\alpha$ -quartz  $\text{SiO}_2$  interface with COMB (pair\_style comb)

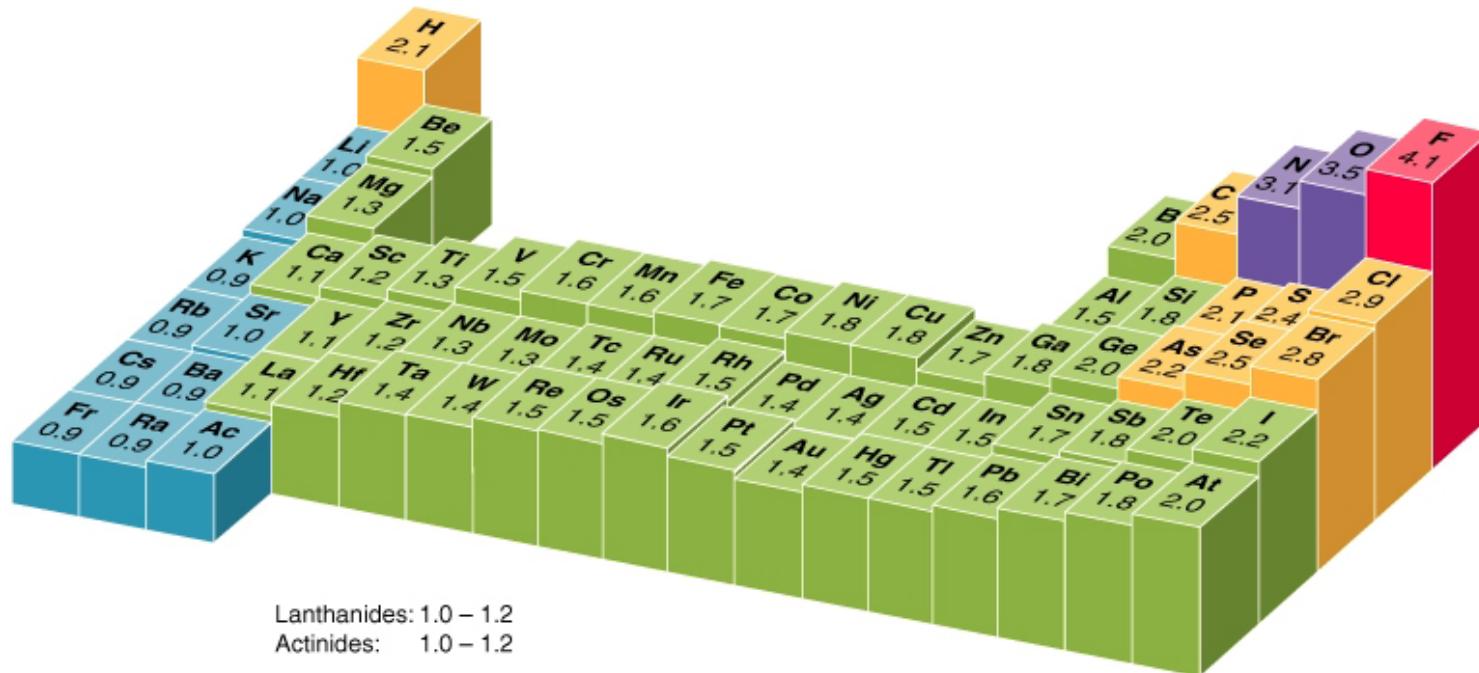


Fang-Yin Lin's talk,  
B2, 2:45, Today

- Variable charge potentials in LAMMPS include:
  - COMB (**comb**, **comb3**), ReaxFF (**reax**, **reax/c**), embedded ion method (**eim**), and Streitz-Mintmire (**coul/sm**)

# Electronegativity

- First proposed by Linus Pauling in 1932
- A chemical property that describes the tendency of an atom to attract electrons (or electron density) towards itself



# Electronegativity

- When two or more atoms combine to form a molecule, their electronegativities are equalized – Sanderson's postulate <sup>a</sup>
- Electronegativity,  $X$ , of any chemical species is the negative of its chemical potential,  $\mu$  <sup>b</sup>

$$\bullet \quad X_i = -\mu_i = -\frac{\partial E(\rho)}{\partial \rho} = e \frac{\partial E(q_i)}{\partial q_i}$$

- At equilibrium, electron density will transfer between atoms so that chemical potential (electronegativity) at all atomic sites are equal

Electronegativity equalization → charge transfer

<sup>a</sup> R. T. Sanderson, *Chemical Bonds and Bond Energy*; Academic, New York (1976)

<sup>b</sup> R. G. Parr, R. A. Donnelly, M. Levy, W. E. Palke, *J. Chem. Phys.* 68, 3801 (1978)

# Electronegativity

- Since electronegativity is the derivative of energy with respect to electron density (charges), it is useful to express electronegativity through expressing energy as a function of charge
- Most basic expression is the sum of atomic polarization energy and electrostatics
  - $E(q_i) = \chi \cdot q_i + \frac{1}{2} \cdot \eta \cdot q_i^2 + \sum_{i < j} q_i \cdot J_{ij} \cdot q_j$
  - $\mu(q_i) = q_i + \eta \cdot q_i + \sum_{i < j} J_{ij} \cdot q_j$
  - Used in ReaxFF and Streitz-Mintmire potentials

A. K. Rappe, W. A. Goddard III, *J. Phys. Chem.* 95 8 (1991)

A. C. T. van Duin, S. Dasgupta, F. Lorant, W. A. Goddard III, *J. Phys. Chem. A* 105 9396 (2001)

F. H. Streitz and J. W. Mintmire, *Phys. Rev. B* 50, 11996 (1994)

# Electronegativity Equalization Method

- Solving equilibrium charges for a system of  $N$  atoms
  - A problem of  $N$  variables
- Based on electronegativity equalization principle
  - $\mu_i = \mu_{i+1} = \dots = \mu_N$
  - $N - 1$  conditions
  - Adding the condition of conservation on total charge
    - $q_{tot} = \sum_i q_i$
- The charge equilibration equations become
  - $CD = -D$

# Electronegativity Equalization Method

- Solving charges with  $CD = -D$

$$\begin{bmatrix} J_{i,j} - J_{1,j} & J_{i+1,j} - J_{1,j} & \cdots & J_{N,j} - J_{1,j} & 1 \\ J_{i,j+1} - J_{1,j+1} & J_{i+1,j+1} - J_{1,j+1} & \cdots & J_{N,j+1} - J_{1,j+1} & 1 \\ \vdots & \vdots & \vdots & \vdots & 1 \\ J_{i,N} - J_{1,N} & J_{i+1,N} - J_{1,N} & \ddots & J_{N,N} - J_{1,N} & 1 \\ q_i & q_{i+1} & \cdots & q_N & 1 \end{bmatrix} \begin{bmatrix} \eta_i - \eta_1 \\ \eta_{i+1} - \eta_1 \\ \vdots \\ \eta_N - \eta_1 \\ -q_{tot} \end{bmatrix} = -\begin{bmatrix} \eta_i - \eta_1 \\ \eta_{i+1} - \eta_1 \\ \vdots \\ \eta_N - \eta_1 \\ -q_{tot} \end{bmatrix}$$

- Solve the sparse matrix problem with a linear conjugate gradient minimization method
  - Fast converging method for solving  $q$ , but only applicable to linear equations
  - $\mu(q_i) = q_i + \eta \cdot q_i + \sum_{i < j} J_{ij} \cdot q_j$

# Electronegativity Equalization Method

- More complicated expression of energy as a function of charge
  - COMB

$$\bullet \quad E(q_i) = E^p(q_i) + \sum_{i < j} q_i \cdot J_{ij} \cdot q_j + \sum_{i < j} V_{ij}(r_{ij}, q_i, q_j)$$

$$E^p(q_i) = \chi \cdot q_i + \frac{1}{2} \cdot \eta_1 \cdot q_i^2 + \frac{1}{3} \cdot \eta_2 \cdot q_i^3 + \frac{1}{4} \cdot \eta_3 \cdot q_i^4$$

$$V_{ij} = A(q) \cdot A e^{-\lambda \cdot r_{ij}} + B(q) \cdot B e^{-\alpha(q) \cdot r_{ij}}$$

- Solving charges with EEM requires iterative, damped dynamics

Yu J., Sinnott S. B., Phillpot, S. R., *Phys. Rev. B* 75 085311 (2007)

Shan T.-R., Devine B. D., Kemper T. W., Sinnott S. B., Phillpot S. R., *Phys. Rev. B* 81 125328 (2010)

# EEM with Damped Dynamics

- Analogous to classical Newtonian dynamics

- $m_i \ddot{r}_i = -\frac{\partial}{\partial r_i} E(\{r_i\}, \{q_i\})$

- $s_i \ddot{q}_i = -\frac{\partial}{\partial q_i} E(\{r_i\}, \{q_i\})$



$$q_{tot} = \sum_i q_i$$

# EEM with Damped Dynamics

- Analogous to classical Newtonian dynamics

- $m_i \ddot{r}_i = -\frac{\partial}{\partial r_i} E(\{r_i\}, \{q_i\})$
- $s_i \ddot{q}_i = -\left( \frac{\partial}{\partial q_i} E(\{r_i\}, \{q_i\}) - \frac{1}{N} \sum_i \frac{\partial}{\partial q_i} E(\{r_i\}, \{q_i\}) \right)$

# EEM with Damped Dynamics

- Analogous to classical Newtonian dynamics

- $m_i \ddot{r}_i = -\frac{\partial}{\partial r_i} E(\{r_i\}, \{q_i\})$
- $s_i \ddot{q}_i = -\left(\frac{\partial}{\partial q_i} E(\{r_i\}, \{q_i\}) - \frac{1}{N} \sum_i \frac{\partial}{\partial q_i} E(\{r_i\}, \{q_i\})\right)$
- $s_i \ddot{q}_i = -\mu_i + \bar{\mu} - \eta_d \dot{q}_i$

- Also known as the Extended Lagrangian method
  - Damped dynamics with fixed damping
  - Large damping facilitates convergence, but leads to instability more easily

# Summary and Outlooks

- Current variable charge fixes are implemented independently
  - fix qeq/reax
  - fix qeq/comb
  - fix qeq/sm
  - Pair\_style eim has its own built-in variable charge routines
- These qeq fixes will be reorganized/modified into one fix
  - fix qeq
  - fix\_modify qeq style *cg* (*conjugate gradient*) or *dd* (*damped dynamics*)
- Main advantage is easy to expand and include more qeq styles
  - E.g. SQE<sup>1</sup>, QTPIE<sup>2</sup>, etc

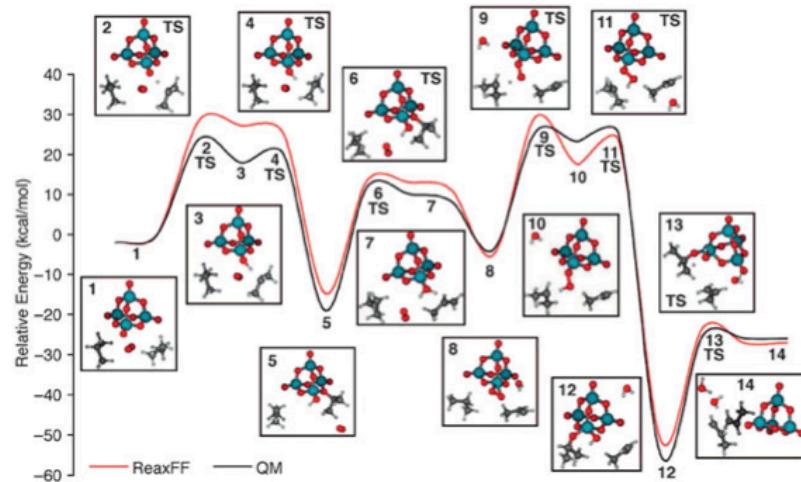
<sup>1</sup> D. Mathieu, J. Chem. Phys. 127 224103 (2007)

<sup>2</sup> J. Chen and T. J. Martinez, Chem. Phys. Lett. 438 315 (2007)

# ON-THE-FLY CHEMICAL SPECIES ANALYSIS FOR REAXFF

# Reactive Force Field (ReaxFF)

- $$E^{ReaxFF} = E^{self} + E^{Coul} + E^{vdW} + E^{bond} + E^{angle} + E^{torsion} + E^{conjugation} + E^{H-bond} + E^{lone-pair} + E^{over} + E^{under} + E^{others}$$
- Ability to model chemical reactions
- Trained against QM/QC data
  - Reproduces transition states, energy barriers

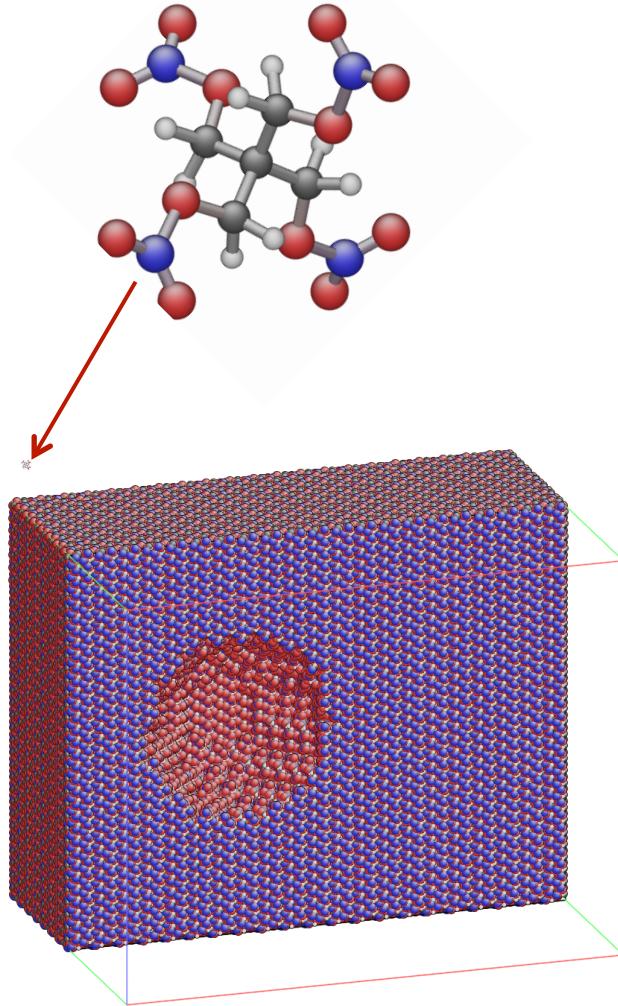


A. C. T. van Duin, S. Dasgupta, F. Lorant, W. Goddard, *J. Phys. Chem. A* 105 9396 (2001)

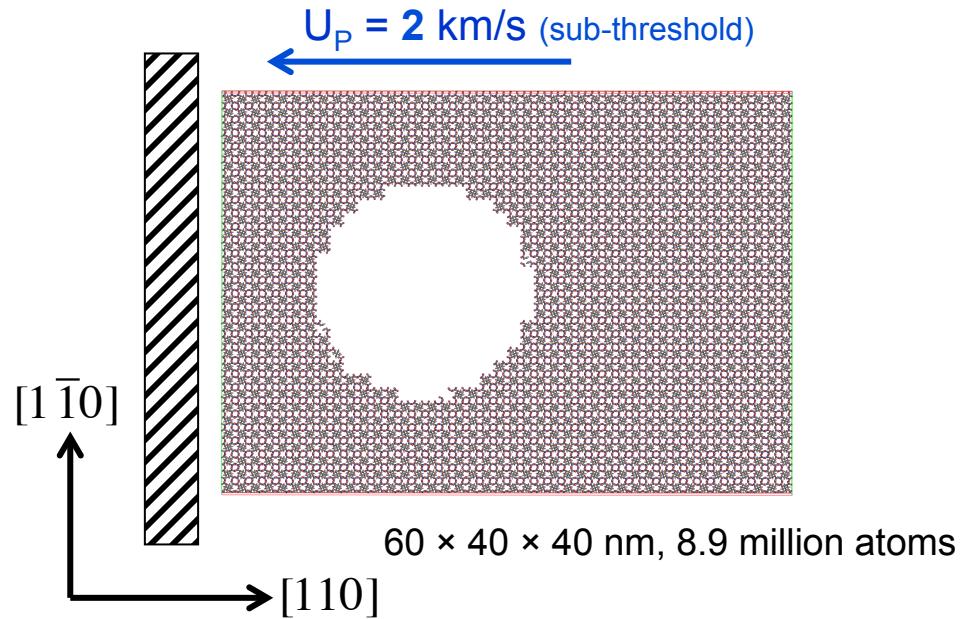
K. Chenoweth, A. C. T. van Duin, W. Goddard, *J. Phys. Chem. A* 112 1040 (2008)

Adri van Duin's talk, Session II, 11:00, Thursday

# Large-Scale Explicit NEMD Simulation of Shockwave Interaction with Spherical Void



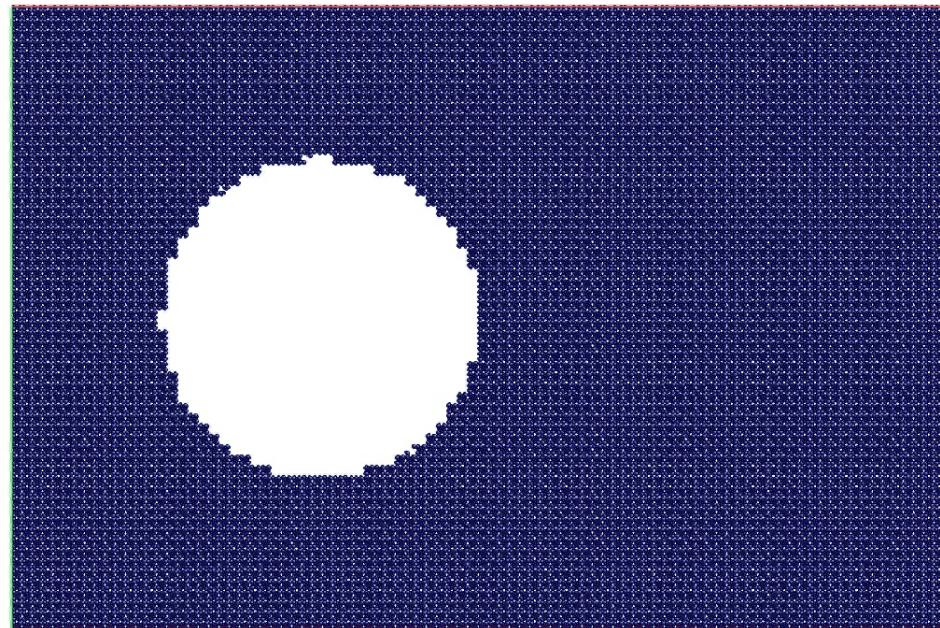
- DOE ASC TLCC2 Chama (Sandia)
  - 256 nodes/4096 MPI tasks
- LAMMPS software
- ReaxFF force field (reax/c)



# Large-Scale Explicit NEMD Simulation of Shockwave Interaction with Spherical Void

- Kinetic energy

$$U_P = 2 \text{ km/s}$$



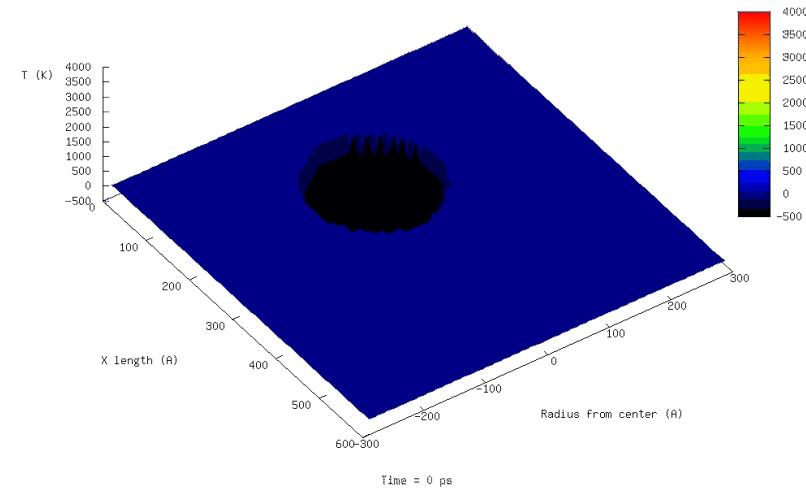
20 kcal/mol  $\approx$  10,000 K

0 kcal/mol

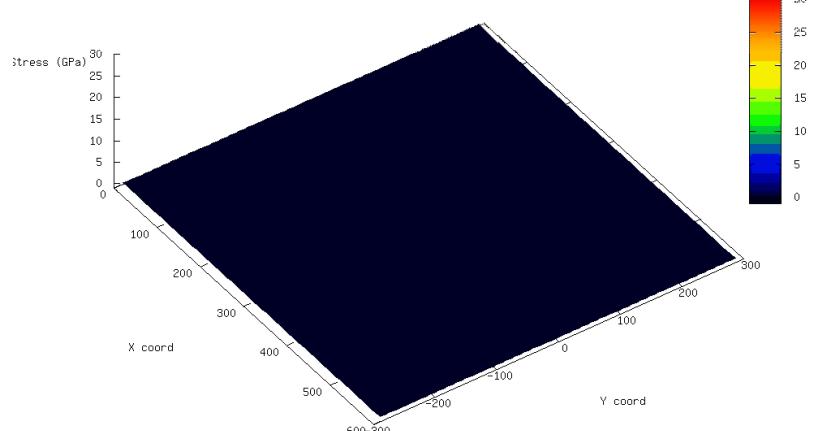
20 nm void  
 $60 \times 40 \times 40 \text{ nm}$   
8.9 million atoms

10 nm

- Temperature



- Stress



# Identify Molecules & Species

- Current (and only) method: with pair\_style reax/c:

- Use “fix reax/c/bonds” to print a connection table
- Post-process the table with a serial program
- Drawbacks:
  - Massive storage required
    - One line per atom
  - Time consuming post-process
    - Single core program
  - No information on spatial distribution of molecules & species

```
# Timestep 2
#
# Number of particles 81983
#
# Max number of bonds per atom 5 with coarse bond order cutoff 0.300
# Particle connection table and bond orders
# id type nb id_1...id_nb mol bo_1...bo_nb abo nlp q
576 1 3 577 581 582 0    0.885    1.216    1.704    3.807    0.000    0.510
13445 1 2 13448 13470 0   2.640    0.764    3.436    0.000    0.289
538 3 2 569 875 0    1.489    0.390    2.027    1.996   -0.493
13466 2 1 528 0    0.801    0.857    0.000    0.398
528 3 2 13466 526 0   0.801    1.054    1.907    2.000   -0.576
577 3 2 576 584 0   0.885    0.609    1.705    2.000   -0.314
589 3 2 13444 674 0   0.850    0.792    1.716    2.000   -0.610
566 3 2 572 536 0   0.672    0.941    1.658    2.000   -0.489
13448 3 1 13445 0   2.640    2.719    1.047   -0.404
569 1 3 538 570 530 0  1.489    0.973    1.649    4.125    0.000    0.448
1844 3 2 558 1869 0   0.483    0.952    1.713    2.000   -0.517
570 2 1 569 0    0.973    1.041    0.000    0.191
13447 2 1 13446 0   0.966    0.995    0.000    0.196
530 3 1 569 0    1.649    1.864    2.000   -0.416
526 4 3 528 13492 555 0  1.054    0.914    0.539    2.537    1.000    0.236
1869 2 1 1844 0   0.952    0.981    0.000    0.432
821 3 2 555 601 0   0.707    0.882    1.777    2.000   -0.615
13658 2 1 585 0   0.855    0.930    0.000    0.409
555 4 4 526 821 13710 561 0  0.539    0.707    1.132    0.373    2.754    1.000    0.266
601 2 1 821 0   0.882    0.910    0.000    0.429
536 2 1 566 0   0.941    0.943    0.000    0.365
581 1 3 576 571 579 0   1.216    1.252    1.305    3.773    0.000   -0.058
13444 2 1 589 0   0.850    0.927    0.000    0.407
585 3 3 13658 13505 561 0  0.855    0.471    0.476    1.908    2.000   -0.446
674 2 1 589 0   0.792    0.899    0.000    0.462
584 4 4 577 561 846 541 0  0.609    0.770    0.878    0.744    3.049    0.986   -0.126
13710 3 2 555 817 0   1.132    0.719    1.899    2.000   -0.469
13470 1 3 13445 13713 13446 0   0.764    1.287    2.005    4.057    0.000    0.191
817 2 1 13710 0   0.719    0.979    0.000    0.380
561 4 3 555 585 584 0   0.373    0.476    0.770    1.877    1.011    0.105
853 1 3 13777 599 828 0   1.306    1.249    0.968    3.543    0.000    0.432
...
```

# Identify Molecules & Species

- Would not it be great if we can:
  - Avoid storing huge output files?
  - Avoid post-processing with serial programs?
  - Monitor molecules and species on-the-fly?
  - Know where and when specific molecules/species are formed?
- Solution is a new fix: “reax/c/species”
  - **fix ID group-ID reax/c/species Nevery Nrepeat Nfreq filename keyword value ...**
  - Analyzes chemical bonds, molecules, and species based on time-averaged or instantaneous bond order values
  - Currently limited to pair\_style reax/c
    - But extension to other reactive potentials (**tersoff**, **rebo/airebo**, **bop**, **comb**, etc) is made as simple as possible

# Species Analysis

- Output type 1:

# Timestep	No_Moles	No_Specs	C5H8O12N4
2	2827	1	2827

# Timestep	No_Moles	No_Specs	H2O3N	H2O	HO	CH2O3	ON2	.....
55002	6703	747	43	1557	1537	8	31	.....

- Terse list, know what and how many molecules right away

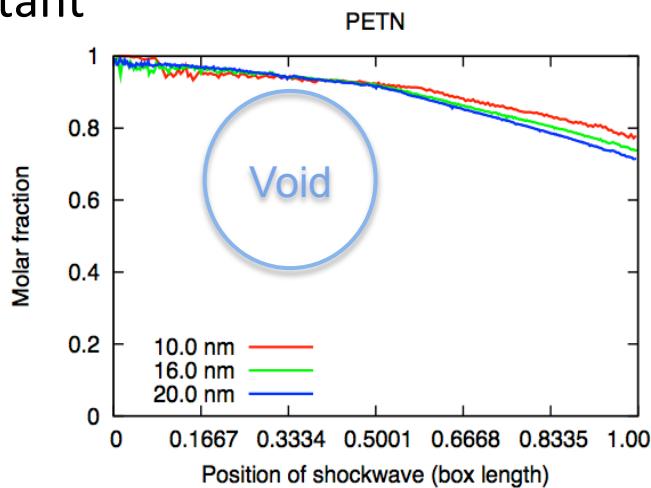
- Output type 2:

```
Timestep 55002 NSpec 747 NMole 6703 xlo 0.000000 xhi 121.397880 ylo 0.953317 yhi 79.582283 zlo -1.443159 zhi 57.372959
ID Atom_Count Type Ave_q CoM_x CoM_y CoM_z
1 6 H2O3N -0.02388735 0.00604353 0.03255288 0.62153236
2 28 C4H8O9N7 0.02785239 0.01054783 0.27594189 0.55659111
3 296 C67H46O129N54 -0.01571570 0.06200146 0.85039233 0.44433890
4 3 H2O 0.07147703 0.02367206 0.10731024 0.41775836
5 38 C13H2O17N6 -0.03316714 0.04845567 0.21833137 0.58398634
6 2 HO -0.14814854 0.02654568 0.04087529 0.62640116
7 25 C8H7O9N 0.00647330 0.03278529 0.05240849 0.48259218
8 2 HO -0.00285301 0.03098041 0.08792044 0.58878768
.....
```

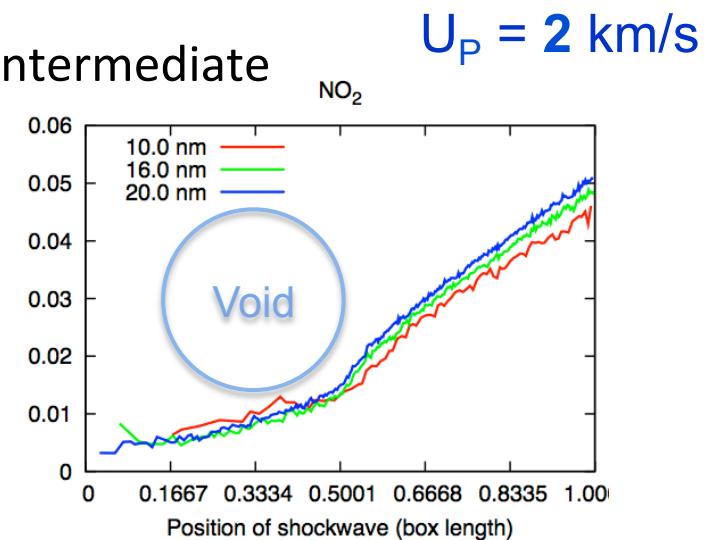
- Generates cfg files with a small analysis program

# Chemical species analysis

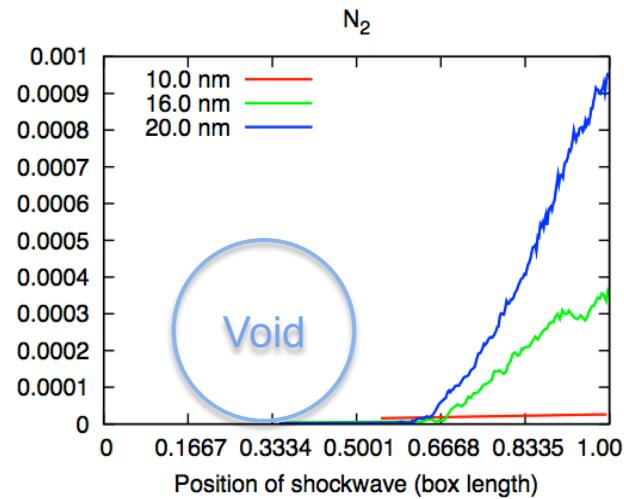
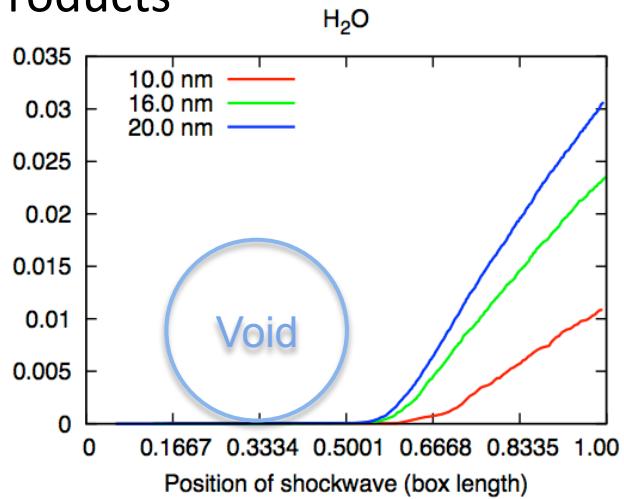
- Reactant



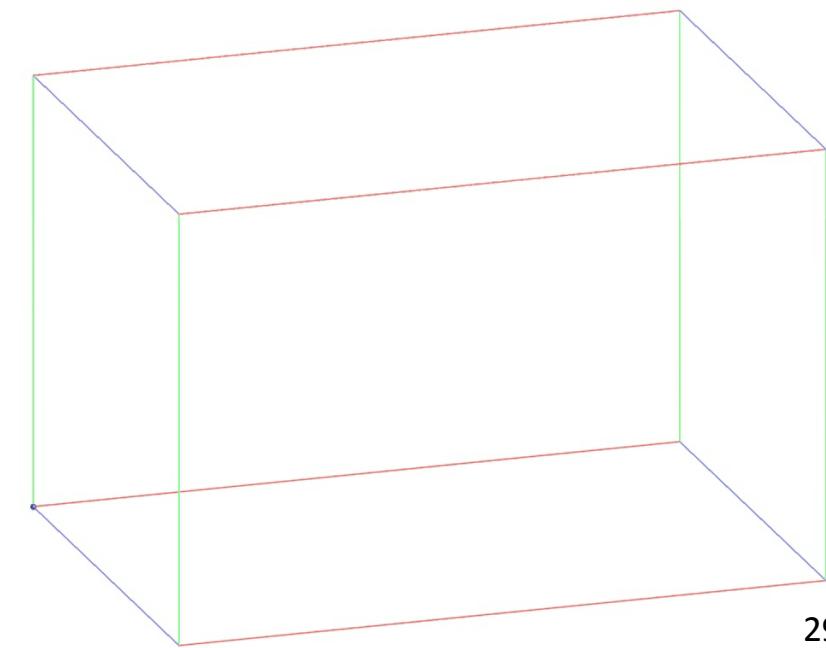
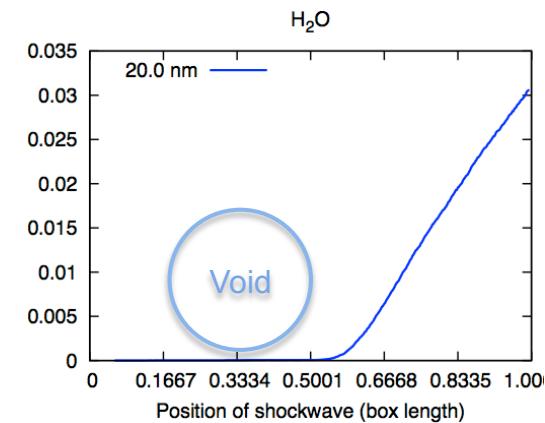
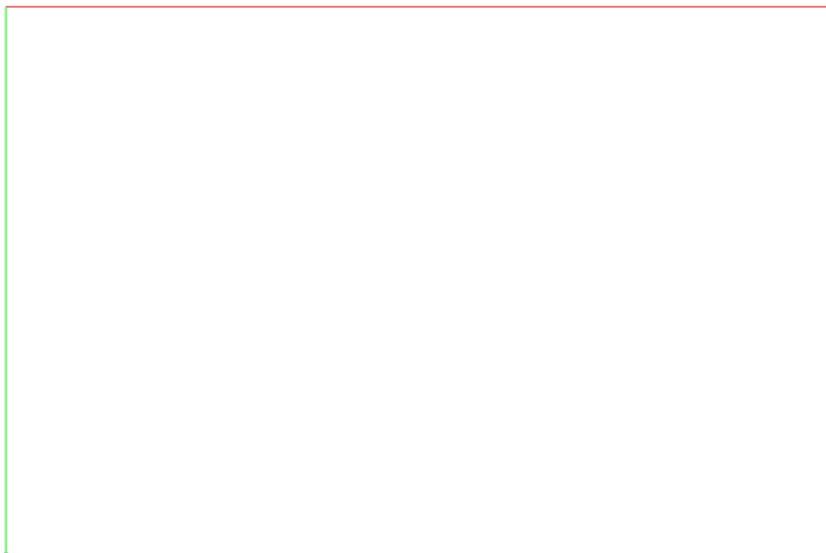
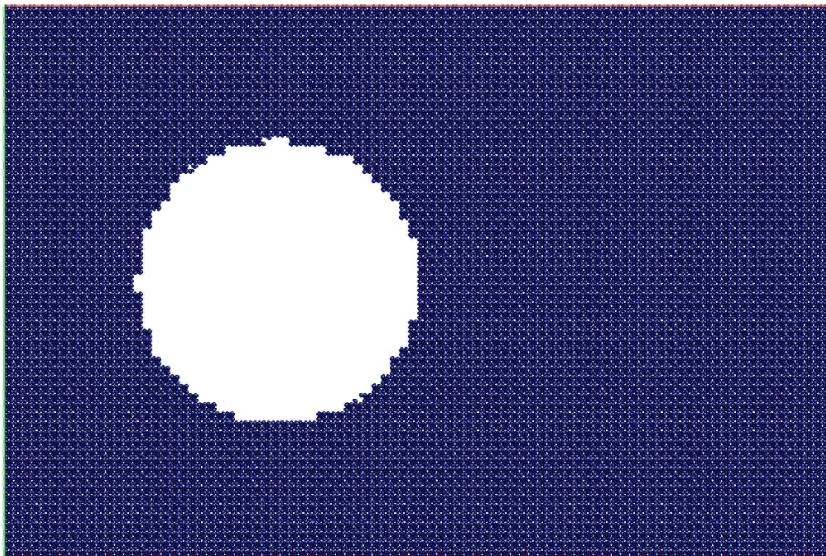
- Intermediate



- Final Products



# Formation of H<sub>2</sub>O: 20 nm void, 2 km/s



# Summary and Outlooks

- On-the-fly, real-time chemical species analysis based on bond order values
- Currently limited to pair\_style reax/c
  - Can be extended to other bond order pair styles

# Conclusions

- Advanced force fields
  - Reactive (bond order), Variable charge, and Others (electron orbitals, automated machine-learning)
  - Allow modeling of bond forming/breaking (chemical reactions), charge transfer, and more
- Streitz-Mintmire will be released
  - Applicable to all pair\_styles via hybrid
- Variable charge fixes will be reorganized/modified
  - Allows easy extension to include more QE<sub>q</sub> styles
- Fix reax/c/species can be extended to more reactive potentials
  - Volunteers?

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- Chris Weinberger, Shawn Coleman (Sandia, Arkansas)
- Oleg Sergeev (VNIIA)
  
- Sandia National Laboratories is a multi-program laboratory managed and operated by Sandia Corporation, a wholly owned subsidiary of Lockheed Martin Corporation, for the U.S. Department of Energy's National Nuclear Security Administration under contract DE-AC04-94AL85000.